

## MPI and Scalable Parallel Performance Analysis

25 Years of MPI Workshop, ANL, September 25, 2017





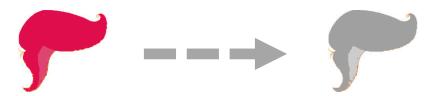
## Fair Warning/Disclaimer

The views expressed by this presentation are mine and not necessarily those of Intel

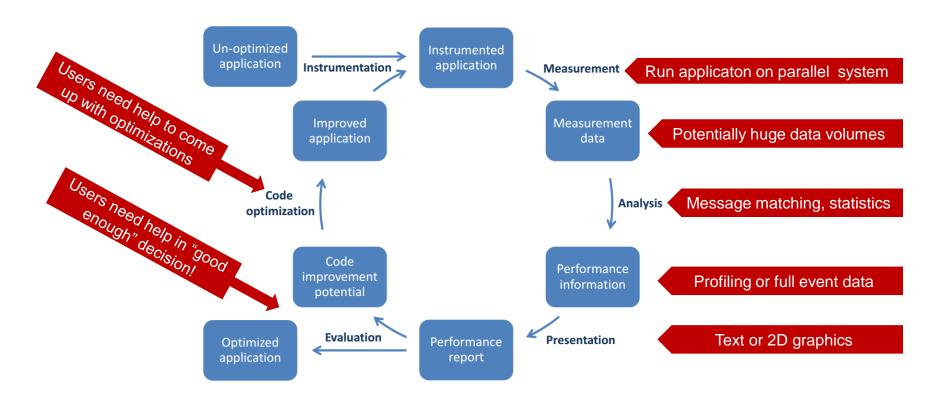
Lots of the graphical material shown comes from parallel tools projects (ANL/Jumpshot, BSC Extrae/Paraver/Dimemas,, JSC/Scalasca, Score-P, TU-D/Vampir, ...)

I'm ignoring most of the more lightweight, pure profiling tools

Getting involved with MPI can lead to this:



## The Performance Analysis/Optimization Cycle



## Scalable Parallel Performance Analysis Today

#### Several well-established portable tools families

- Europe: BSC Extrae/Paraver, JSC Scalasca, TU-Dresden Vampir
- US: TAU

#### Very few commercial tools

Know only of Intel Cluster Tools and Allinea/ARM MAP

#### Scalability to the 100000s of processes

- Both Scalasca and Vampir have demonstrated this
- Key is to use massive parallelism for analysis and (graphical) presentation

#### On- and off progress in tools integration/interoperability

- Score-P as latest effort covers TAU and two European tool families
- Generally, data file formats can be converted

#### Limited progress in correctness checking & modeling

- Tools tend to report the status quo, can't extrapolate or answer "what if" questions
- MPI semantics are a harsh mistress most mistakes keep your code from working (debugger time)



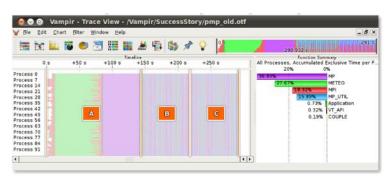


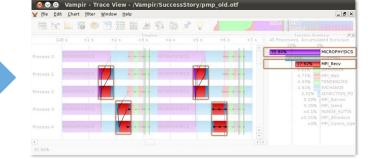


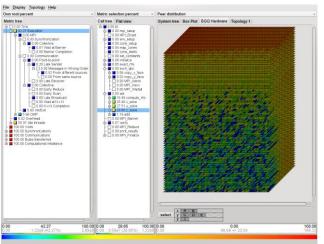


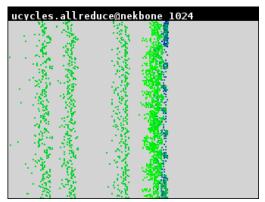


## A few Colourful Graphics

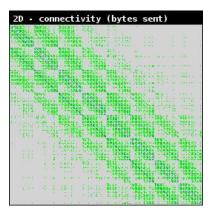








Zoom

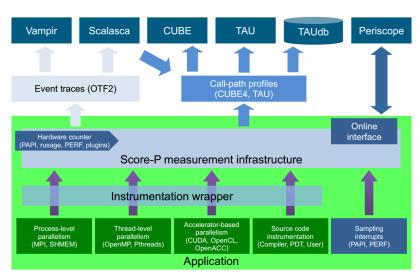


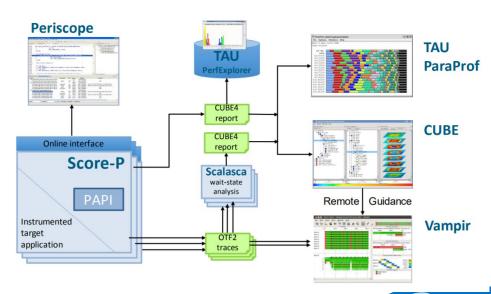
## Integration and Interoperability

Data interoperability is key here - want to be able to look at the same trace data through different lenses/tools

Not rocket science, yet trace formats have become quite complex

### **US/European Score-P initiative**





## MPI Advancing the Tools Field – the Good

### Profiling interface

- Provides a transparent & reliable way to intercept calls & record data
- Gives access to all application-visible MPI-related data

### Communicator concept

- Enables clear separation of application and tools communication
- Critical to achieve reliable tool operation
- Tools did immediately use MPI internally

### MPI debugging I/F

Could build tools that attach to running applications

#### Market effects

- Portability → tools (reasonable easily) portable to all systems supporting MPI
- Users → reach a vastly larger user community due to only one "message passing model" for all systems & applications
- Clear & orthogonal semantic → reduce effort required for analysis code

## MPI Advancing the Tools Field – the (Slightly) Bad

### **Limited MPI introspection**

- Can't see "inside" the MPI calls or the progress engine
- Some analysis questions are hard to answer
  - Why is MPI call XYZZY taking so long?
  - How much time is taken up by MPI SW stack vs. network stack & transmission?
- This is a bigger problem for MPI-2 "one-sided" operations, f.i.

## No way to record message matching

- To match sends and receives, all tools replay the MPI message matching rules
- This can break down when watching only parts of application runs

## Are we Done Yet?

### Couple of hard problems do remain

- Trace data deluge
- End-user information overload & required expertise
- Answering the \*real\* end-user questions
  - How good is my code, and what could optimizations achieve?
  - How well does it scale?
  - How will it run on a different system?

Couple of ideas/references in the following slides

## Data Deluge – On-Demand Trace Collection

# Tracefiles are *always* too big (recent example: 3 TB for a NLP ML application on 64 processes)

- Want to be able to safely en/disable tracing without screwing up message matching
- Want to be able to safely cut recorded tracefiles
- Prefer automatic triggers to assist

### Before you ask

End-users often unable/unwilling to cut down workloads

#### Ideal world

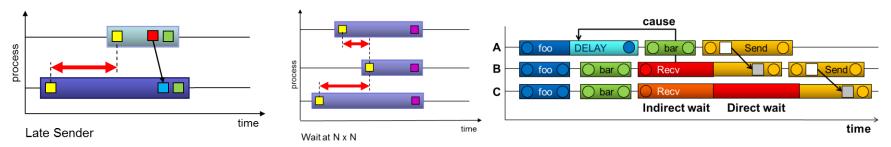
- Traces are collected when a performance metric indicates a problem
- Lightweight monitoring produces the underlying data, ML techniques as trigger

## Identifying Performance Problems

Current tools largely assume a "black belt" expert in the drivers seat

This seriously limits their take-up

Some tools try to identify MPI bottlenecks and link to root causes in the program (Scalasca as example)



This pretty much requires replay of an application

#### We need more of this

- Hard-coding rules does not scale at all
- ML techniques could have a role here

## Modeling & What-If Scenarios (1)

### BSC Dimemas replay tool

- Replay application run with CPU scaling and communication model
- Assess impact of MPI implementation and interconnect: replay with BW= $\infty$ , Latency=0 & no contention  $\rightarrow$  this has proven to be very useful



### BSC multiplicative performance model

Partition parallel efficiency into three factors

$$\eta_{_{11}} = T \times LB \times \mu_{LB}$$

- $\eta_{\parallel} = T \times LB \times \mu_{LB}$  Transfer (T): effect of the interconnect network
- Load balance (LB): difference in work between processes
- Serialisation ( $\mu_{LB}$ ): process dependencies and transient load imbalances

### Division of responsibilities

- μ<sub>IB</sub> and LB are the application developer's problem
- T can be addressed by MPI and system developers



## Modeling & What-If Scenarios (2)



Fit & extrapolate efficiency factors, usually resulting in depressing predictions

## Scalability analysis with Extra-P

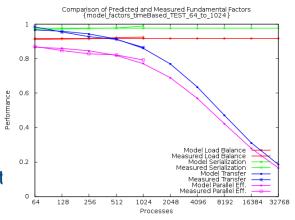
• Measure and fit the scaling behaviour of code component (block, MPI calls)  $b_i$ 

 $R_n(x) = \sum_{i} a_i x^{\frac{b_i}{c_i}} + \sum_{i} \log_2^{d_j}(x)$ 

Scaling model is the sum of all component models

$$R(x) = \sum_{n} R_n(x)$$

- Integrated wit Scalasca infrastructure
- Give it a try!



## Where MPI Could Help in the Future

### Wish #1 – Message matching

- Avoid need to replay communication and re-match messages
- MPI-internal mechanism or ways to extend the message header
- Fundamental to address the data deluge

## Wish #2 – Addtl. Introspection (MPI\_T?)

- Collect data on separate (logical) phases in MPI operations
- Examples
  - Data type processing vs. transmission of serial byte stream
  - Completion of one-sided operations
  - Data volumes in and out for collectives
- Callback method preferred
- Prescribed, strict semantics??

## The POP Project



### POP – Performance Optimisation and Productivity

- European govt.-funded project (term 2015-2018)
- Partners include BSC and JSC as tools providers

### **Objectives**

- Promote best practices in parallel programming
- Offer services to
  - Gain detailed understanding of application and system behavior
  - Propose how to refactor applications in the most productive way
- Cover academic as well as industrial users
- Support MPI and/or OpenMP

#### Success so far

- 72 performance audits, 5 completed PoCs (36 and 8 are WIP)
- Very favourable feedback from customers ...

## Semi-Useful Links ...

```
Argonne MPI performance tools
```

https://www.mcs.anl.gov/research/projects/perfvis

#### BSC performance tool suite

– <u>https://tools.bsc.es/</u>

#### Vampir tool

https://www.vampir.eu/

#### Scalasca tool

– https://www.scalasca.org/

#### Extra-P tool

https://www.scalasca.org/software/extra-p/

#### Score-P effort

https://www.vi-hps.org/projects/score-p/

### POP project

https://pop-coe.eu/